



On the Performances of Estimating Stellar Atmospheric Parameters from CSST Broad-band Photometry

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Abstract

Deriving atmospheric parameters of a large sample of stars is of vital importance to understand the formation and evolution of the Milky Way. Photometric surveys, especially those with near-ultraviolet filters, can offer accurate measurements of stellar parameters, with the precision comparable to that from low/medium resolution spectroscopy. In this study, we explore the capability of measuring stellar atmospheric parameters from Chinese Space Station Telescope (CSST) broad-band photometry (particularly in the near-ultraviolet bands), based on synthetic colors derived from model spectra. We find that colors from the optical and near-ultraviolet filter systems adopted by CSST show significant sensitivities to the stellar atmospheric parameters, especially the metallicity. According to our mock data tests, the precision of the photometric metallicity is quite high, with typical values of 0.17 and 0.20 dex for dwarf and giant stars, respectively. The precision of the effective temperature estimated from broad-band colors are within 50 K.

Key words: methods: data analysis – stars: abundances – surveys

1. Introduction

The current oldest stars in the Milky Way are supposed to be the Population II stars whose progenitors are the first stars—the so called Population III stars (Lardo et al. 2021). It is thought that the first stars formed in hundreds of millions of years only after the big bang as a consequence of condensation of cosmological mini-halos. Consisting of H, He and trace amounts of Li, mini-halos are cooled via molecular hydrogen with cooling efficiency far less than that of metal. Therefore, the first stars are supposed to be massive stars (Ishigaki et al. 2021; Zepeda et al. 2022). Metals formed in their short lives are ejected into interstellar medium through supernova explosions, which is the first time for the enrichment of primordial gas that leads to the formation of the second stars with low masses (Heger & Woosley 2002; Umeda & Nomoto 2002; Heger & Woosley 2010; Limongi & Chieffi 2012; Nomoto et al. 2013; Ishigaki et al. 2018).

Metallicity is the fossil record of the birth place of the star. We thus can figure out the nature of the first stars by searching for the most metallicity deficient stars in the Milky Way. As an example, we can constrain the baryon number to photon number ratio η (Beers & Christlieb 2005) by measuring

abundance of Li in very metal-poor stars. Moreover, we can determine the metallicity distribution function (MDF) of the Galaxy to explore the chemical enrichment at the early stage of the Milky Way (Bonifacio et al. 2021).

The key to the above scientific problems is the precise estimate of stellar atmospheric parameters for a huge sample of stars, in particular the metallicity. These have partly been done by spectroscopic surveys in the past few decades, which greatly improves our understanding of the assembly history of the Galaxy. However, the raw number of stars targeted by spectroscopic surveys is limited to the order of 10^6 , far behind the number achieved by photometric survey (like Pan-STARRS1; Chambers et al. 2016) and astrometric one (like Gaia; Gaia Collaboration et al. 2016). Moreover, the complex selection functions should also be properly dealt with in the studies based on spectroscopic data (Ivezić et al. 2008; Huang et al. 2022). On the other hand, as summarized in Huang et al. (2022), stellar atmospheric parameters in the particular metallicity of dozens of million stars can be precisely measured from photometric surveys with near-ultraviolet bands such as the Sloan Digital Sky Survey (SDSS, York et al. 2000), the SkyMapper Southern Survey (SMSS, Wolf et al. 2018; Onken et al. 2019), the Pristine survey (Starkenburg et al. 2017), the Stellar Abundances and Galactic Evolution Survey (SAGES,

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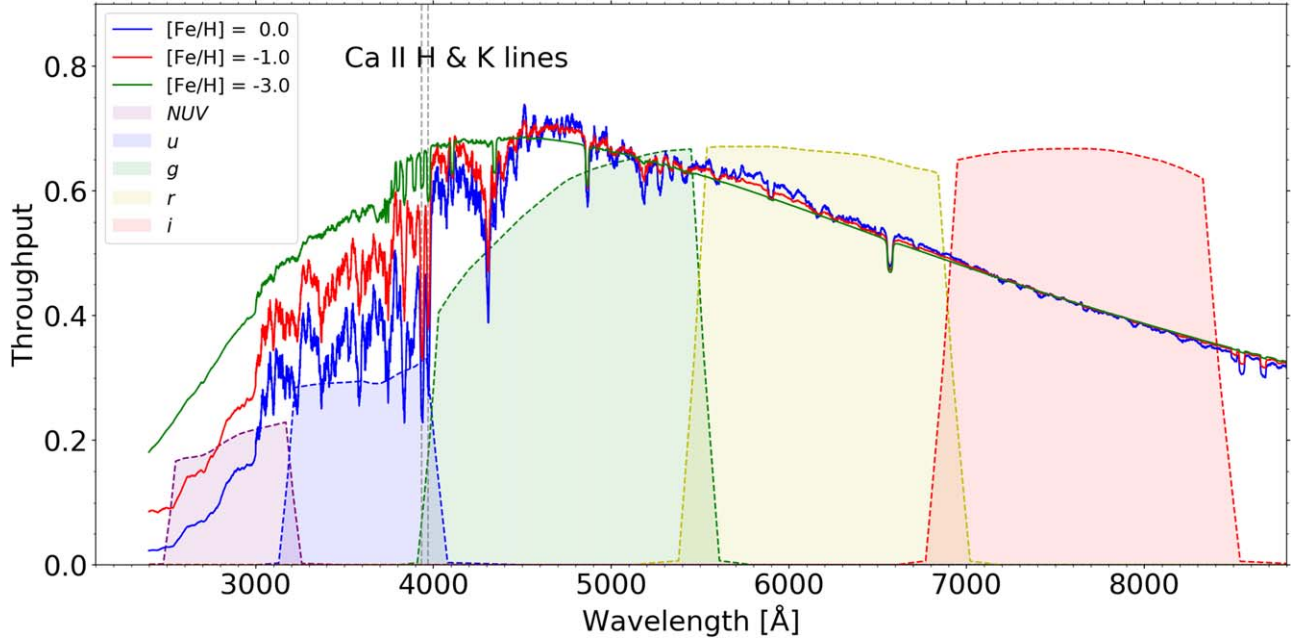


Figure 1. The sensitivity of CSST broad-band filters to stellar metallicity. Three spectra with various metallicities are shown, where the blue, red, and green ones represent $[\text{Fe}/\text{H}]$ equal to 0, -1 , -3 , respectively. They are normalized using fluxes ranging from 7000 to 7500 Å. The effective temperature and surface gravity of them are the same, with values of 5800 K and 4.50, respectively.

Zheng et al. 2018; Fan et al. 2023), the Javalambre Physics of the Accelerating Universe Astrophysical Survey (J-PAS, Benitez et al. 2014), the Javalambre Photometric Local Universe Survey (J-PLUS, Cenarro et al. 2019), the Southern Photometric Local Universe Survey (S-PLUS, Mendes de Oliveira et al. 2019; Whitten et al. 2021) and the Chinese Space Station Telescope (CSST, Zhan 2011). The recent efforts based on surveys with narrow/medium near-ultraviolet bands have shown the precision of metallicity is comparable to that from low/medium resolution spectroscopy (e.g., Huang et al. 2019, 2022; Lin et al. 2022; Huang et al. 2023).

In this study, we focus on the CSST, a 2 m space telescope with a field of view 1.1 deg^2 . It is planned to be launched into the low earth orbit (LEO) in 2025 to carry out large-scale sky survey covering nearly $17,500 \text{ deg}^2$ at high Galactic latitude ($b \geq 15^\circ$) with g band limiting magnitude down to around 26.3 (5σ point-like source). The CSST is equipped with seven filters NUV , u , g , r , i , z , y with wavelength ranging from 2000 Å to $1.1 \mu\text{m}$. With such large sky coverage and survey depth, the future CSST data will provide a revolutionary view of our Galaxy, especially the outer halo in an unprecedented volume. It should be specially mentioned that the atmospheric parameters of a large sample of stars will be achieved with its NUV and u bands, as well as slitless spectra although with shallower limiting magnitude. This study attempts to explore the capability of measuring stellar atmospheric parameters from the CSST broad-band colors. As a glance in Figures 1 and 2,

the CSST NUV and u bands show significant sensitivities to the stellar surface gravity and metallicity.

This paper is organized as follows. In Section 2, we briefly introduce the adopted theoretical spectra and calculations of stellar colors. In Section 3, the sensitivity of color to stellar atmospheric parameters is explored in details. Classification of stars is carried out, as illustrated in detail in Section 4. Tests on estimates of metallicity and effective temperature from the CSST filter systems are shown in Section 5 and Section 6, respectively. Finally, we summarize our results and make discussions in Section 7.

2. Theoretical Spectra and Calculations of Stellar Colors

2.1. Theoretical Spectra

Theoretical spectra library can offer us high-resolution spectra with wide parameter space coverage, the high-resolution spectra can be degraded to any lower one upon our requests. For this study, we have downloaded 4542 high resolution spectra from the PHOENIX synthetic library⁸ (Husser et al. 2013). It covers $3000 \text{ K} \leq T_{\text{eff}} \leq 10,000 \text{ K}$, $0.0 \leq \log g \leq 6.0$, $-4.0 \leq [\text{Fe}/\text{H}] \leq +0.5$, and $0.0 \leq [\alpha/\text{Fe}] \leq 0.6$; the parameter coverages are shown in Figure 3. The high resolution spectra cover the wavelength range from 500 to 55,000 Å with resolving power of $R = 500,000$ in the

⁸ <https://phoenix.astro.physik.uni-goettingen.de/>

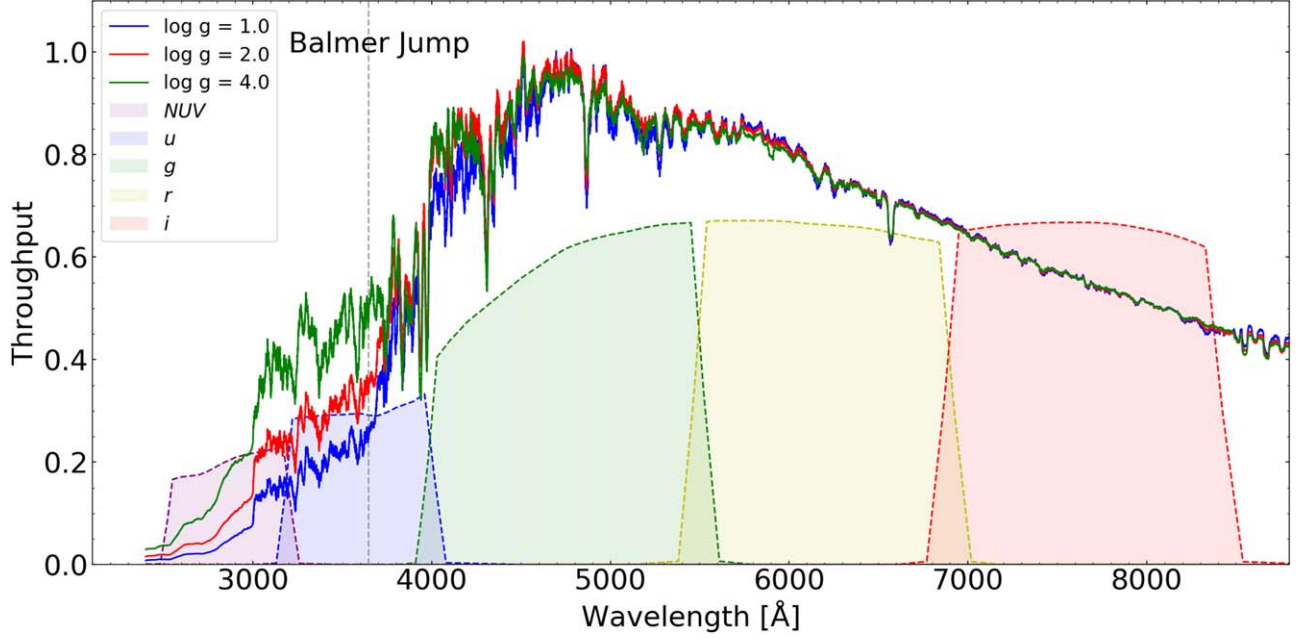


Figure 2. The sensitivity of CSST broad-band filters to surface gravity. Three spectra with various surface gravities are shown. They are again normalized using fluxes ranging from 7000 to 7500 Å. The effective temperature and metallicity of them are the same, with values of 5800 K and 0.0, respectively.

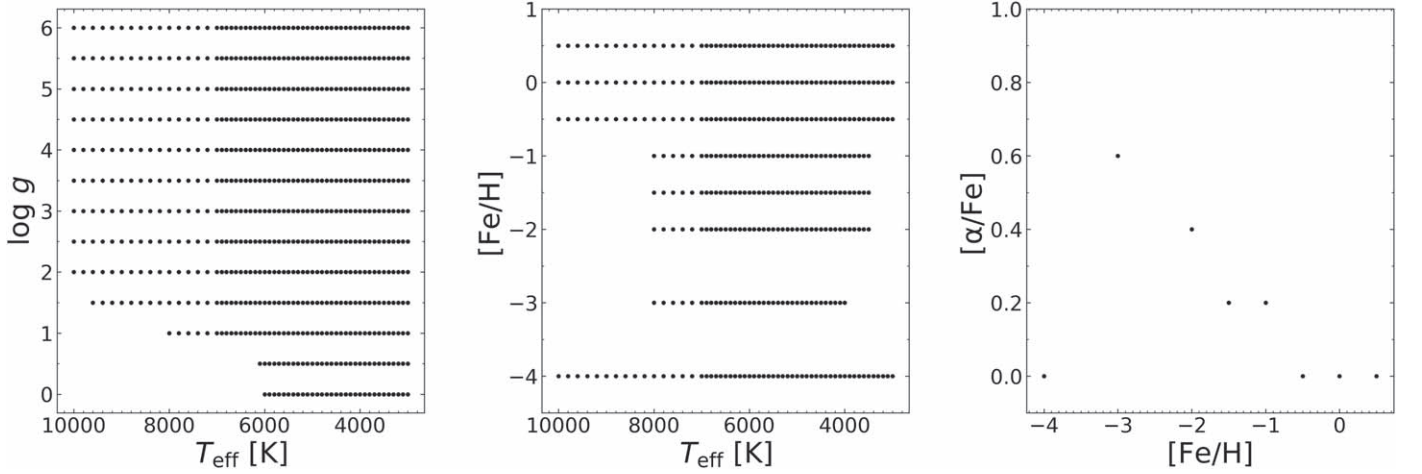


Figure 3. The parameter coverage of the theoretical spectra in $T_{\text{eff}}-\log g$ diagram (left panel), $T_{\text{eff}}-[\text{Fe}/\text{H}]$ diagram (middle panel) and $[\text{Fe}/\text{H}]-[\alpha/\text{Fe}]$ plane (right panel). It is worth noting that no alpha-enhanced spectra are provided for ultra metal-poor stars ($[\text{Fe}/\text{H}] = -4.0$) in PHOENIX synthetic library.

optical and near-infrared (3000–25,000 Å), $R = 100,000$ in the infrared region (25,000–55,000 Å), and $\Delta\lambda = 0.1$ Å in the UV (500–3000 Å).

2.2. Calculations of Synthetic Colors

Once the transmission curves of the filter systems (see Figures 1 and 2) and theoretical spectra are given, synthetic colors can be calculated by proper convolutions (Casagrande & Vandenberg 2014). Here we adopted the AB magnitude

system which is defined as:

$$m_{\text{AB}} = m_{\text{ST}} - 5 \log \lambda_{\text{pivot}, \zeta} + 18.6921, \quad (1)$$

where m_{ST} is ST monochromatic magnitudes defined as

$$m_{\text{ST}} = -2.5 \log \frac{\int_{\lambda_i}^{\lambda_f} \lambda f_{\lambda} T_{\zeta} d\lambda}{\int_{\lambda_i}^{\lambda_f} \lambda T_{\zeta} d\lambda} - 21.10, \quad (2)$$

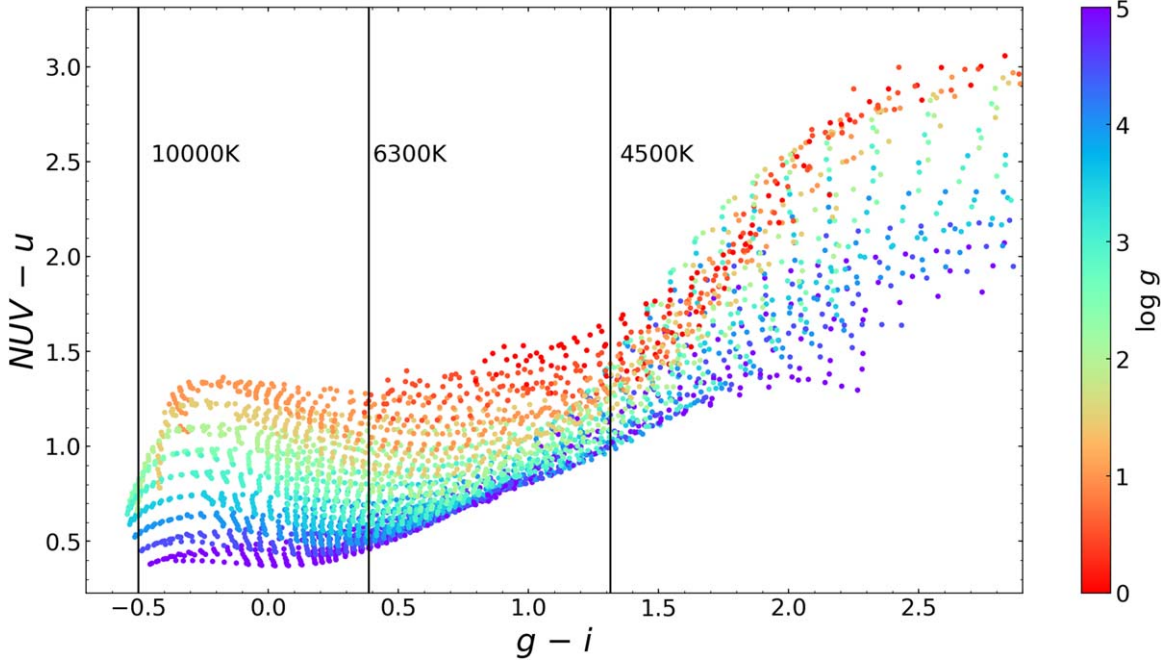


Figure 4. Sensitivity of color to $\log g$ of stars from CSST filter systems in the $(NUV - u)$ vs. $(g - i)$ plane, color coded by $\log g$, as shown by the right color bars. The values of $\log g$ range from 0 to 6 dex.

Table 1
Sensitivity of Color $NUV - u$ to Surface Gravity

Sensitivity	4500–6300 K		6300–10,000 K	
	μ_1 (mag dex ⁻¹)	σ_1 (mag dex ⁻¹)	μ_2 (mag dex ⁻¹)	σ_2 (mag dex ⁻¹)
All stars	0.1146	0.1004	0.1913	0.0663
1.0–1.5	0.2045	0.0642	0.2409	0.0840
1.5–2.0	0.2098	0.0640	0.2005	0.0556
2.0–2.5	0.1701	0.0595	0.2222	0.0377
2.5–3.0	0.1343	0.0630	0.2356	0.0258
3.0–3.5	0.0938	0.0606	0.2135	0.0280
3.5–4.0	0.0431	0.0592	0.1895	0.0335
4.0–4.5	0.0256	0.0403	0.1582	0.0415
4.5–5.0	−0.0007	0.0323	0.1192	0.0531

Note. Here μ_i , σ_i ($i = 1, 2$) is the mean value and scatter of the sensitivity in various temperature bins, respectively. The first row is the total sensitivity, the remaining rows are for different bins of surface gravity with range specified. The sensitivity of $\log g$ from 0 to 1 is not listed since there are no data with $\log g = 0, 0.5$ above 6000 K. Moreover, stars with $\log g > 5.0$ are excluded in the calculation of the sensitivity, given their extremely low possibilities in the real observations.

where ζ is bandpass ranging from λ_i to λ_f , f_λ is the flux at specific wavelength, T_ζ is throughput of a certain filter. $\lambda_{\text{PIVOT},\zeta}$ is defined as

$$\lambda_{\text{PIVOT},\zeta} = \left(\frac{\int \lambda T_\zeta d\lambda}{\int \frac{T_\zeta}{\lambda} d\lambda} \right)^{\frac{1}{2}}. \quad (3)$$

By adopting the transmission curves of CSST filters, we thus integrate magnitudes and their combined colors using the aforementioned downloaded theoretical spectra.

3. Sensitivity of Color to Stellar Atmospheric Parameters

Based on the above synthetic color calculations, we now can evaluate the sensitivities of CSST colors on estimations of stellar atmospheric parameters. First, the stellar effective temperature can be derived from colors with two bands having separation in central wavelength (e.g., $g - i$, $g - z$ or $g - y$). According to previous studies (e.g., Ramírez & Meléndez 2005; Casagrande et al. 2010; Huang et al. 2015), the metallicity effect cannot be ignored in effective temperature determinations; but weak metallicity

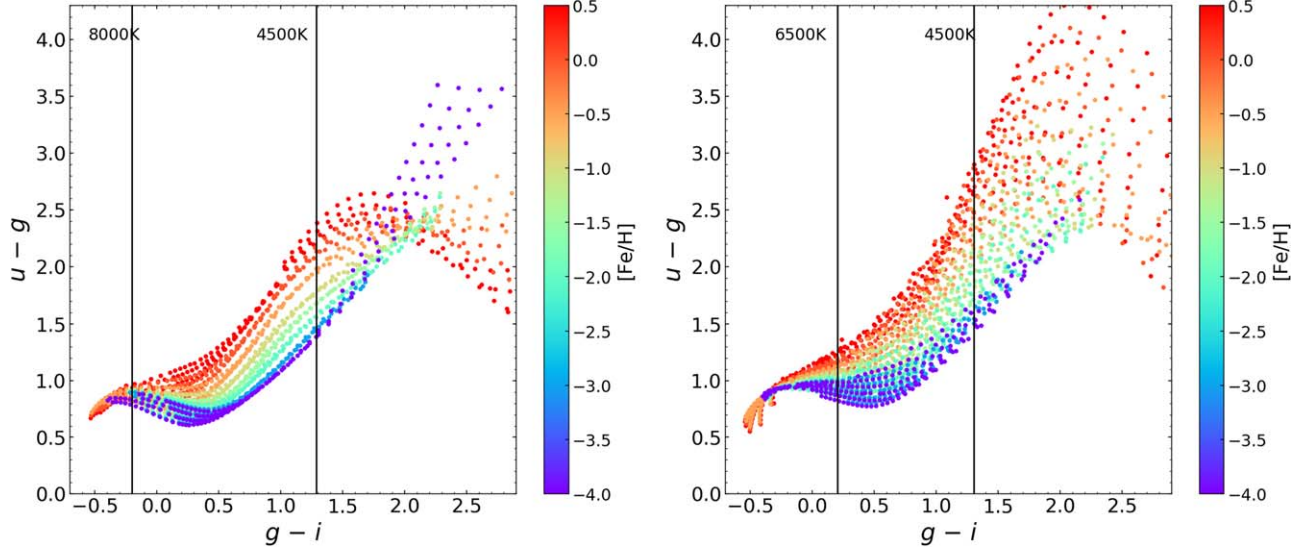


Figure 5. Sensitivity of color to metallicity from CSST filter systems in the $(u - g)$ vs. $(g - i)$ plane for the dwarf stars ($\log g \geq 3.5$ dex; left panel) and giant stars ($\log g < 3.5$ dex; right panel), color coded by metallicity $[\text{Fe}/\text{H}]$, as shown by the right color bars. The values of $[\text{Fe}/\text{H}]$ range from -4 dex to $+0.5$ dex for both panels.

dependence could be found for some T_{eff} -color relations, where the latter is a combination of optical and near-infrared bands. Therefore, colors of $g - i$, $g - z$ and $g - y$ are adopted for effective temperature estimates; the detailed relations will be constructed in Section 6.

Second, the color $NUV - u$ is thought of as an indicator of surface gravity. As shown in Figure 4, this color shows significant sensitivity to $\log g$ between 6300 and 10,000 K. The sensitivity becomes weak for G/K-type (T_{eff} between 4500 and 6300 K) stars, but basically one can distinguish dwarf and giant stars based on $NUV - u$. Sensitivity is notably reduced for cool stars with $T_{\text{eff}} < 4500$ K. Quantitatively, the sensitivity is calculated as the gradient of $NUV - u$ along $\log g$, $\Delta(NUV - u)/\Delta \log g$, at a given $g - i$ bin (equivalent to the effective temperature bin). The results are listed in Table 1. The sensitivity from 6300 to 10,000 K is quite high with the mean sensitivity of $0.19 \text{ mag dex}^{-1}$, and a small scatter of $0.07 \text{ mag dex}^{-1}$. For G/K-type stars, the sensitivity remains quite well for giant stars and drops toward increasing $\log g$. In summary, the color $NUV - u$ is a good indicator to classify dwarf/giant for any star hotter than 4500 K.

CSST color $(u - g)$ can be used to estimate stellar metallicity. Figure 5 shows the sensitivity of color to metallicity for the dwarf and giant stars. It can be clearly seen that the color shows significant sensitivity to stellar metallicity spanning a wide temperature range for both dwarf stars (4500–8000 K) and giant stars (4500–6500 K). Quantitatively, the sensitivity is calculated as the gradient of $u - g$ along $[\text{Fe}/\text{H}]$, $\Delta(u - g)/\Delta[\text{Fe}/\text{H}]$, at a given $g - i$ bin. The results are listed in Table 2. Generally, the sensitivity decreases with decreasing $[\text{Fe}/\text{H}]$ but holds quite well until $[\text{Fe}/\text{H}]$ down to -3.0 . Overall, the sensitivity of giant stars is larger than that of dwarf stars.

Table 2
Sensitivity of Color $u - g$ to Metallicity

Sensitivity	Dwarf Star		Giant Star	
	μ_1 (mag dex $^{-1}$)	σ_1 (mag dex $^{-1}$)	μ_2 (mag dex $^{-1}$)	σ_2 (mag dex $^{-1}$)
All stars	0.1437	0.1373	0.1815	0.1539
0.0 to +0.5	0.3356	0.1388	0.4239	0.1849
−0.5 to −0.0	0.2798	0.1275	0.3534	0.1808
−1.0 to −0.5	0.2249	0.1288	0.2841	0.1593
−1.5 to −1.0	0.1431	0.0693	0.1808	0.0887
−2.0 to −1.5	0.1022	0.0647	0.1292	0.0788
−3.0 to −2.0	0.0442	0.0222	0.0559	0.0282
−4.0 to −3.0	0.0195	0.0148	0.0247	0.0176

Note. Here μ_i , σ_i ($i = 1, 2$) is the mean value and scatter of the sensitivity. The first row is the total sensitivity, the remaining rows are for different bins of metallicity with range specified.

We caution that the above sensitivity analysis is based on the PHOENIX theoretical library. However, the synthetic spectra cannot model the real ones perfectly, especially in the ultraviolet region (wavelength smaller than 3000 Å), which is the key region to derive stellar parameters. This would be a limitation of our sensitivity analysis. For example, the recent study (by Lu et al. 2023) indicates that NUV from GALEX shows significant sensitivities to metallicity, while the CSST NUV predicted by synthetic spectra only shows moderate sensitivities to metallicity.

4. Classification of the Stars

As illustrated in Section 3, color $NUV - u$ is thought as an indicator of surface gravity. In this section, we test the classification of stars by using color $NUV - u$. The original

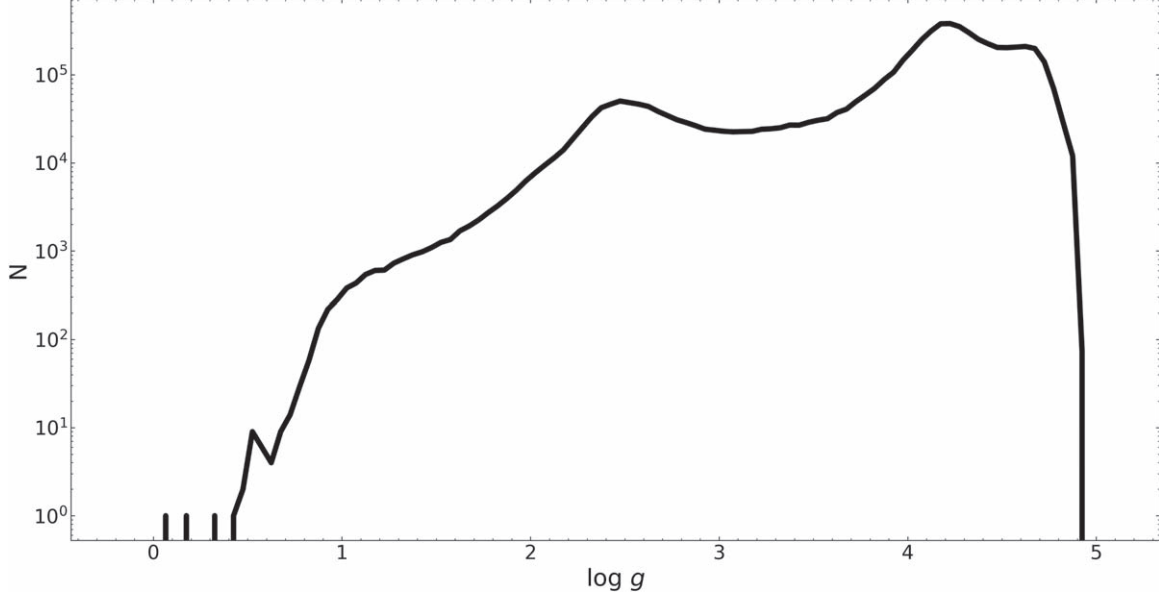


Figure 6. The distribution of stellar surface gravity $\log g$ revealed from LAMOST DR8.

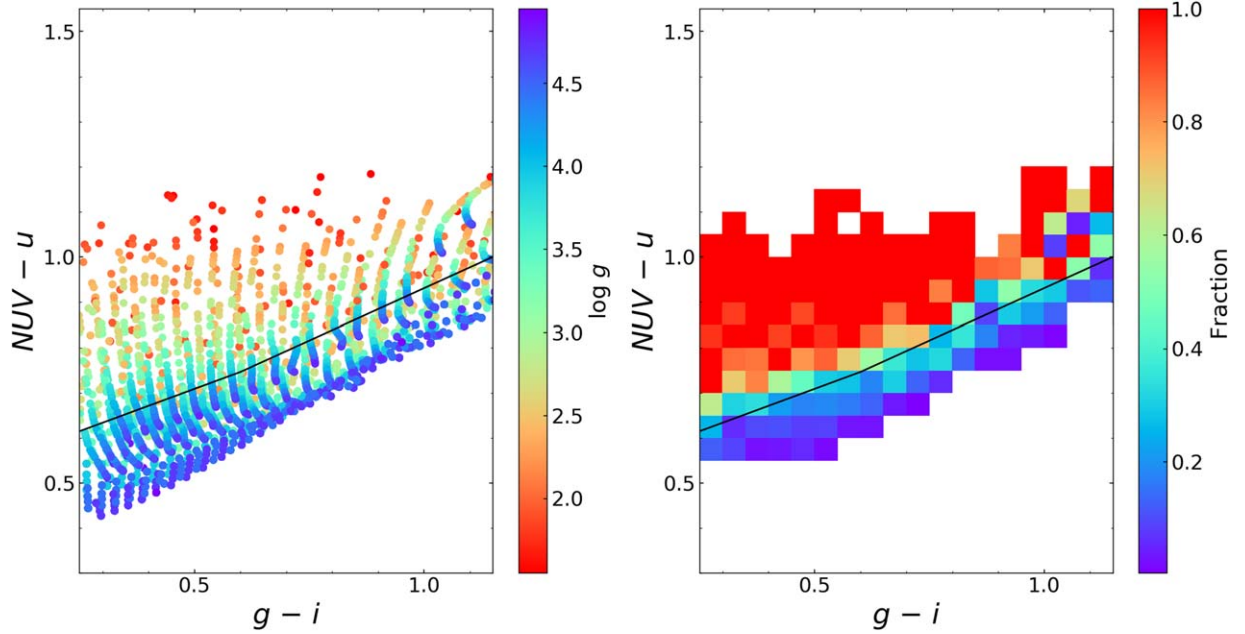


Figure 7. Left panel: $(NUV-u)$ vs. $(g-i)$ of the stars, color coded by $\log g$, as shown by the right color bars. Right panel: distribution of giant stars ($\log g < 3.5$) in the $(NUV-u)$ vs. $(g-i)$ plane (with a bin size of 0.05 mag in each axis). Black lines in both panels denote the cuts that we apply to distinguish dwarf and giant stars.

parameter space coverage is too sparse ($0.5 \text{ dex for } \log g \geq 0$). We thus integrate the theoretical spectra to a step of 0.05 dex by using the PHOENIX high-resolution library.

We mainly focus on the classification of FGK-type stars (4500–6600 K) in this work. To simulate a realistic situation, the observational surface gravity distribution (equal to

luminosity function) is adopted from stellar samples of LAMOST DR8 (<http://www.lamost.org/dr8/v2.0/catalogue>). The distribution of $\log g$ shown in Figure 6 is used to re-sample the number of used theoretical spectra and their colors. Furthermore, we enlarge our sample by repeated sampling five times.

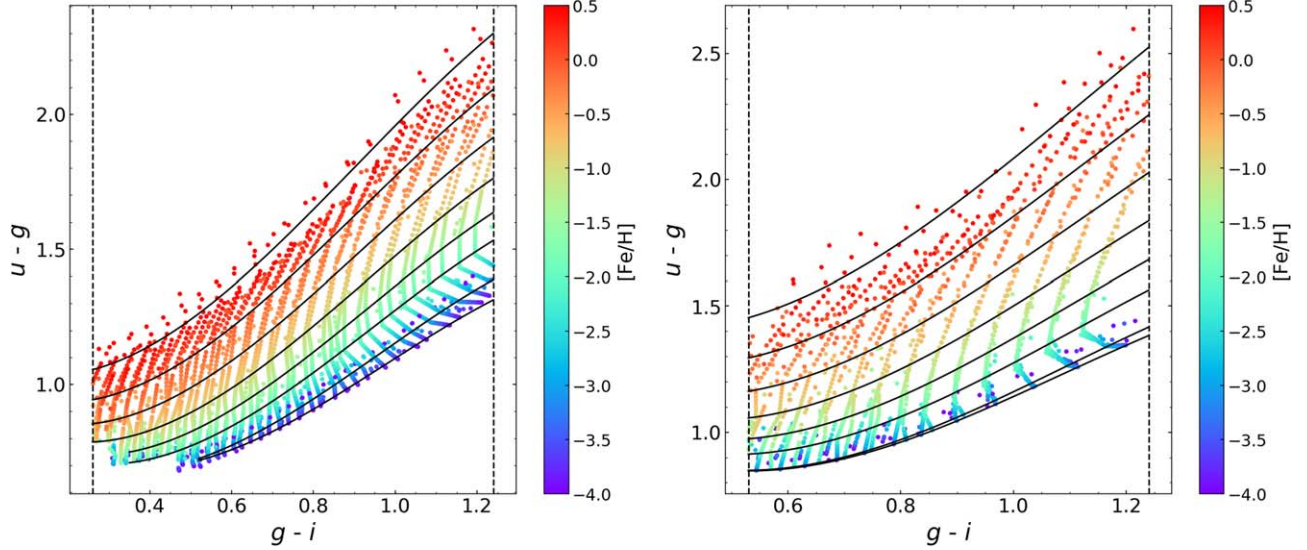


Figure 8. Distribution of the dwarf stars (left panel) and giant stars (right panel) in the $(u-g)$ vs. $(g-i)$ plane, color coded by metallicities $[\text{Fe}/\text{H}]$, as shown by the right color bars. The black lines represent our best fits for different values of $[\text{Fe}/\text{H}]$, as described by Equation (8). From top to bottom, the values of $[\text{Fe}/\text{H}]$ are $+0.5$, 0.0 , -0.5 , -1.0 , -1.5 , -2.0 , -3.0 and -4.0 , respectively. The dashed lines mark the color region that the fits are adopted.

Table 3

Coefficients for Metallicity and Effective Temperature Estimates for Dwarf and Giant Stars

Coeff.	$(u-g)_{\text{dwarf}}$	$(u-g)_{\text{giant}}$	$T_{\text{eff, dwarf}}$	$T_{\text{eff, giant}}$
$a_{0,0}$	1.00914783	1.75846485	0.662 174 87	0.699 588 33
$a_{0,1}$	0.13730156	0.16147817	-0.00643389	-0.01426616
$a_{0,2}$	0.04259072	0.03699292	-0.01095072	-0.01687791
$a_{0,3}$	0.00248219	0.00270348
$a_{1,0}$	-0.84918537	-2.56274845	0.35698828	0.28526773
$a_{1,1}$	0.25060675	0.224588 36	-0.03341913	-0.04121234
$a_{1,2}$	0.01201316	0.03500375
$a_{2,0}$	2.52952155	3.77376427	-0.0046996	0.02679721
$a_{2,1}$	-0.04099565	0.03681587
$a_{3,0}$	-0.91951624	-1.11547021

There are 13,916 stars in our final sample (2177 giant stars with $\log g < 3.5$ and 11,739 dwarf stars with $\log g \geq 3.5$), as shown in Figure 7. In order to select giant stars with a minimum contamination from dwarf stars, we empirically define the color cuts that roughly follow the isonumber-ratio of 60% in the contour. This yields

$$(NUV - u) \geq 0.375(g - i) + 0.5212 \quad (4)$$

$$(NUV - u) \geq 0.462(g - i) + 0.469 \quad (5)$$

With the above cuts, 1069 stars are selected as giant stars (with 815 dwarf stars as contamination). The completeness of the selected giant stars is therefore around 49% (1069/2177), along with a 57% (1069/1884) purity.

Dwarf stars are chosen with the opposite color cuts that yields

$$(NUV - u) < 0.375(g - i) + 0.5212 \quad (6)$$

$$(NUV - u) < 0.462(g - i) + 0.469 \quad (7)$$

With the above cuts, 10,924 stars are selected as dwarf stars (with 1,108 giant stars as contamination). That means the completeness of the selected dwarf stars is around 93% (10,924/11,739), along with a 91% (10,924/12,032) purity. We note that similar efforts have been explored using colors from the SDSS and SkyMapper surveys (e.g., Huang et al. 2019; Zhang et al. 2021).

5. Tests on Performances of Estimating Metallicity

The main purpose of this section is to figure out how accurate metallicity can be measured from the CSST broadband colors. The original parameter space coverage is too sparse (0.5 dex for $[\text{Fe}/\text{H}] \geq -2.0$, 1 dex for $[\text{Fe}/\text{H}] < -2.0$). We thus integrate the theoretical spectra to a step of 0.05 dex. We then try to construct the metallicity-dependent stellar loci of $u-g$ versus $g-i$; this is the basic relation for further metallicity estimates. To achieve a realistic stellar loci, the observational surface gravity distribution shown in Figure 6 is again used to re-sample the number of used theoretical spectra and their colors. We classify them into two categories: dwarf stars with $\log g \geq 3.5$ and giant stars with $\log g < 3.5$.

The first and most important step is to construct the metallicity-dependent stellar loci. As shown in Figure 8, the sequences of different metallicities ranging from $[\text{Fe}/\text{H}] = -4$

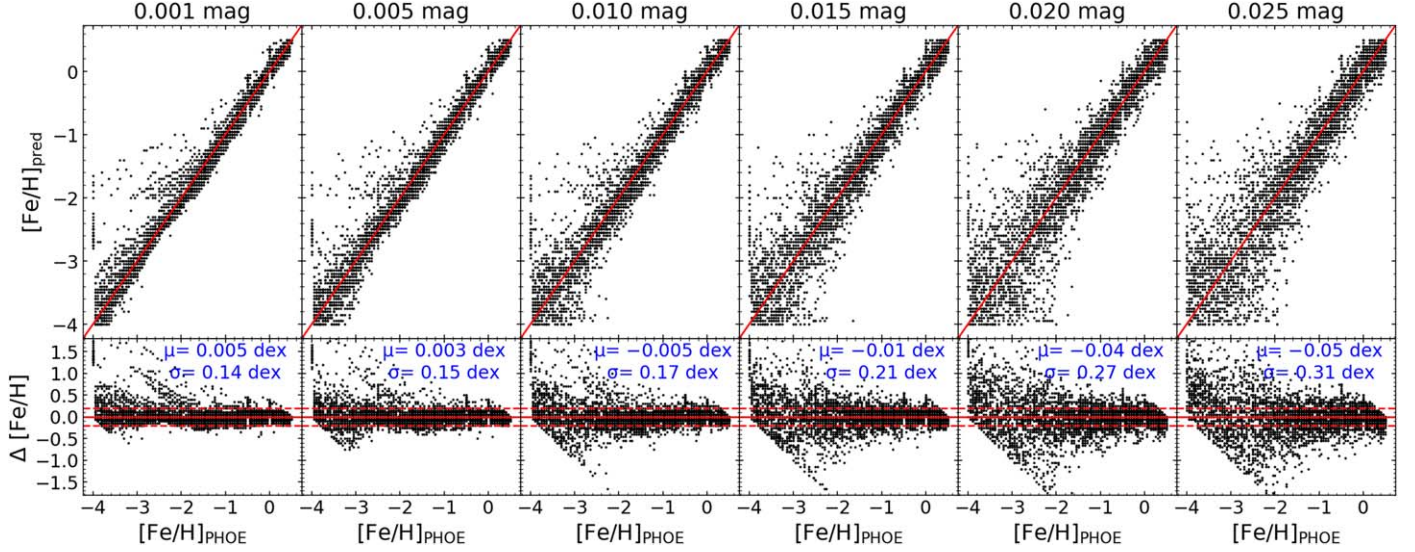


Figure 9. Comparisons of predicted metallicity and metallicity from PHOENIX spectra of dwarf stars for CSST filter systems. The lower parts of each panel is the metallicity difference (predicted metallicity minus metallicity from PHOENIX spectra) as a function of metallicity from PHOENIX spectra. $\Delta [\text{Fe}/\text{H}] = \pm 0.2$ dex lines are plotted to guide the eye. Panels are arranged as a function of random error of color (from the left to the right panels).

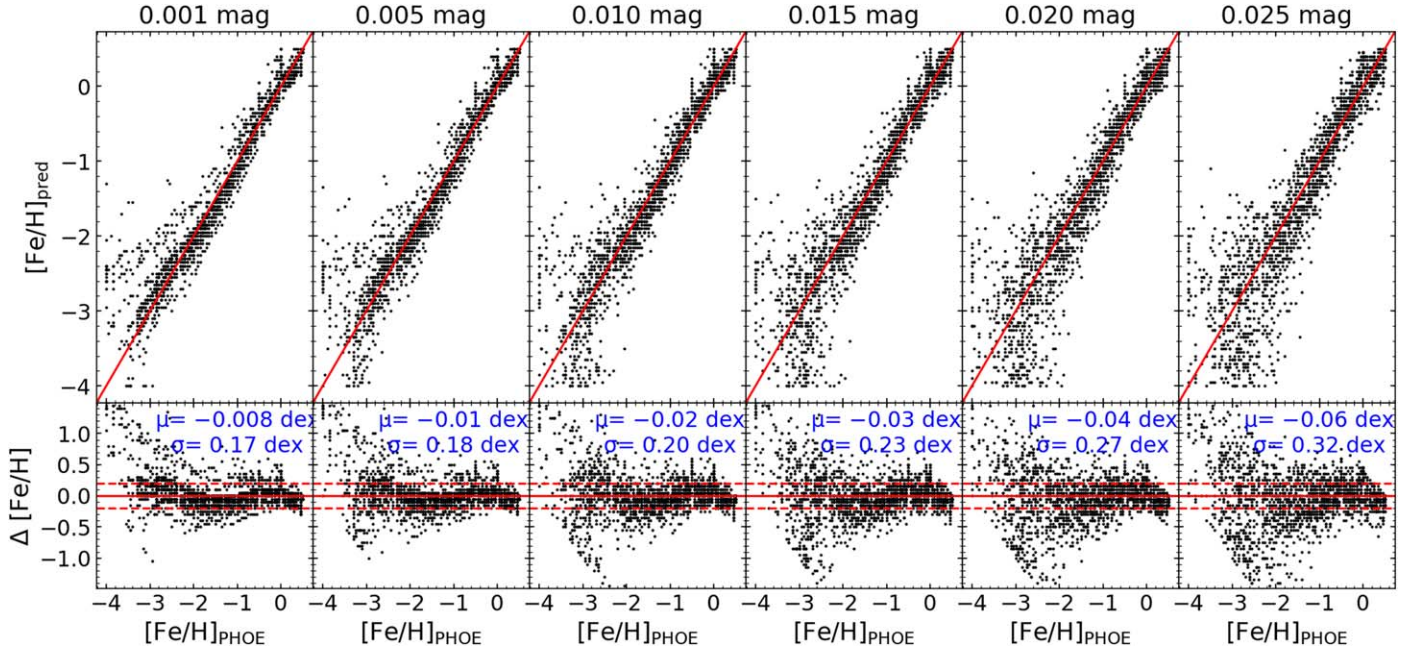


Figure 10. Similar to Figure 9 but for giant stars.

Table 4

Limiting Magnitude of the g Band Under Different Color Errors

Color Error	0.001	0.005	0.01	0.015	0.02	0.025
Limiting magnitude	15.85	19.31	20.77	21.59	22.13	22.57

to $[\text{Fe}/\text{H}] = +0.5$, as color ($u - g$) changing with ($g - i$), can be seen clearly for both dwarf and giant stars. Similar to previous studies (Yuan et al. 2015; Huang et al. 2022; Lin et al. 2022; Huang et al. 2023), third-order 2D polynomials are adopted to fit the color ($u - g$), as a function of ($g - i$) and

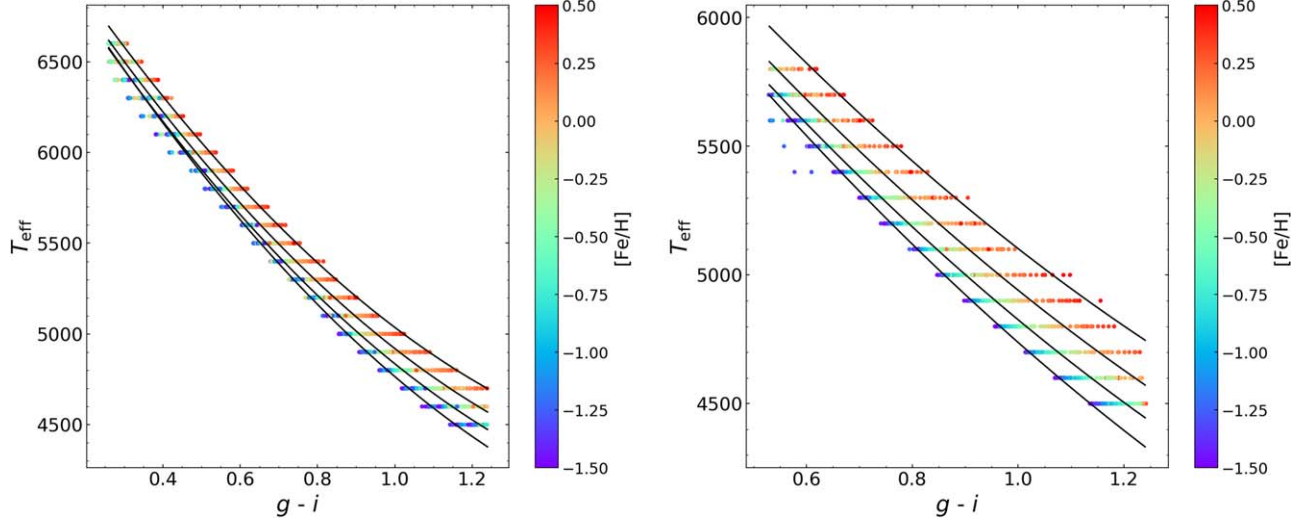


Figure 11. Effective temperature, as a function of color ($u - g$), for the dwarf (left panel) and giant (right panel) stars, color coded by metallicity, as shown in the right color bars. The black lines represent our best fits for different values of $[\text{Fe}/\text{H}]$, as described by Equation (6). From top to bottom, the values of $[\text{Fe}/\text{H}]$ are $+0.5$, 0.0 , -0.5 and -1.5 , respectively.

Table 5

Coefficients for T_{eff} Estimates for Dwarf and Giant Stars from $g - z$ and $g - y$ Colors

Coeff.	$T_{\text{dwarf},g-z}$	$T_{\text{giant},g-z}$	$T_{\text{dwarf},g-y}$	$T_{\text{giant},g-y}$
$a_{0,0}$	0.69098643	0.71306772	0.69702855	0.70894565
$a_{0,1}$	-0.00190293	-0.01194074	-0.00042429	-0.0150918
$a_{0,2}$	-0.00897226	-0.01468411	-0.00924179	-0.01249024
$a_{1,0}$	0.29964223	0.26189104	0.299407	0.26657628
$a_{1,1}$	-0.02588283	-0.02968957	-0.02339048	-0.01839136
$a_{2,0}$	-0.00345118	0.00980925	-0.01344877	0.00278537

$[\text{Fe}/\text{H}]$ for dwarf and giant stars, respectively:

$$(u - g) = a_{0,0} + a_{0,1}y + a_{0,2}y^2 + a_{0,3}y^3 + a_{1,0}x + a_{1,1}xy + a_{1,2}xy^2 + a_{2,0}x^2 + a_{2,1}x^2y + a_{3,0}x^3, \quad (8)$$

where x denotes $(g-i)$ and y denotes $[\text{Fe}/\text{H}]$. Three-sigma clipping is applied during the fitting process and the fit coefficients are listed in Table 3. Using the empirical stellar loci defined above, the maximum-likelihood approach is then adopted to derive metallicity estimates. For a given star, the likelihood is expressed as:

$$L_c = \frac{1}{\sqrt{2\pi}\sigma_{\text{PHOE}}} \exp \frac{-(c_{\text{PHOE}} - c_{\text{pred}})^2}{2\sigma_{\text{PHOE}}^2}. \quad (9)$$

where $c_{\text{PHOE}} = (u - g)$ is assumed to be independent Gaussian variables calculated using PHOENIX spectra, c_{pred} is the same color that can be predicted from our metallicity-dependent stellar loci (i.e., Equation (8)). The value of $[\text{Fe}/\text{H}]$ is varied from -4.0 to $+0.5$, with steps of 0.05 dex, when predicting $(u - g)$. With the likelihood function, the best fit color $(u - g)$

can be derived for each star, the value of $[\text{Fe}/\text{H}]$ corresponding to this best fit color is taken as the predicted $[\text{Fe}/\text{H}]$. It is worth noting that the applicability of $(g - i)$ range exists in the current method of estimating stellar metallicity. It is 0.26 – 1.24 , 0.53 – 1.24 for dwarf and giant stars, respectively. Moreover, the applicable upper and lower limits of $[\text{Fe}/\text{H}]$ in color $(u - g)$ are defined for various $(g - i)$ bins.

CSST, as a planned large-scale deep survey, owns powerful capability of measuring stellar atmospheric parameters, as supported by our mock data tests. It can be seen that predicted metallicity from our metallicity-dependent stellar loci is in good agreement with metallicity from PHOENIX spectra for $[\text{Fe}/\text{H}] > -2$ for both dwarf and giant stars, with typical values around 0.17 dex and 0.20 dex, respectively. For dwarf stars (as shown in Figure 9), the precision of the predicted metallicity is 0.14 dex if colors $u - g$, $g - i$ are with a 0.001 mag random error. Even if the color error is up to 0.015 mag, the scatter is still smaller than 0.21 dex, which can be comparable to that of medium-resolution spectroscopy. Although the scatter becomes larger with increasing color error, the metal-rich parts ($[\text{Fe}/\text{H}] > -2$) still show great agreement with the true value. Figure 10 shows the results on the performances of estimating metallicity for giant stars. The scatter is smaller than 0.23 dex when the random error of colors lies within 0.015 mag, though slightly larger than that from dwarf stars under the same color error. Good agreement also exists even under a color error of 0.025 mag.

Correspondingly, using the tool “Exposure time calculator for space telescope,”⁹ the g band limiting magnitudes under various color errors are derived, as listed in Table 4. We expect

⁹ <https://nadc.china-vo.org/csst-bp/etc-ms/etc.jsp>

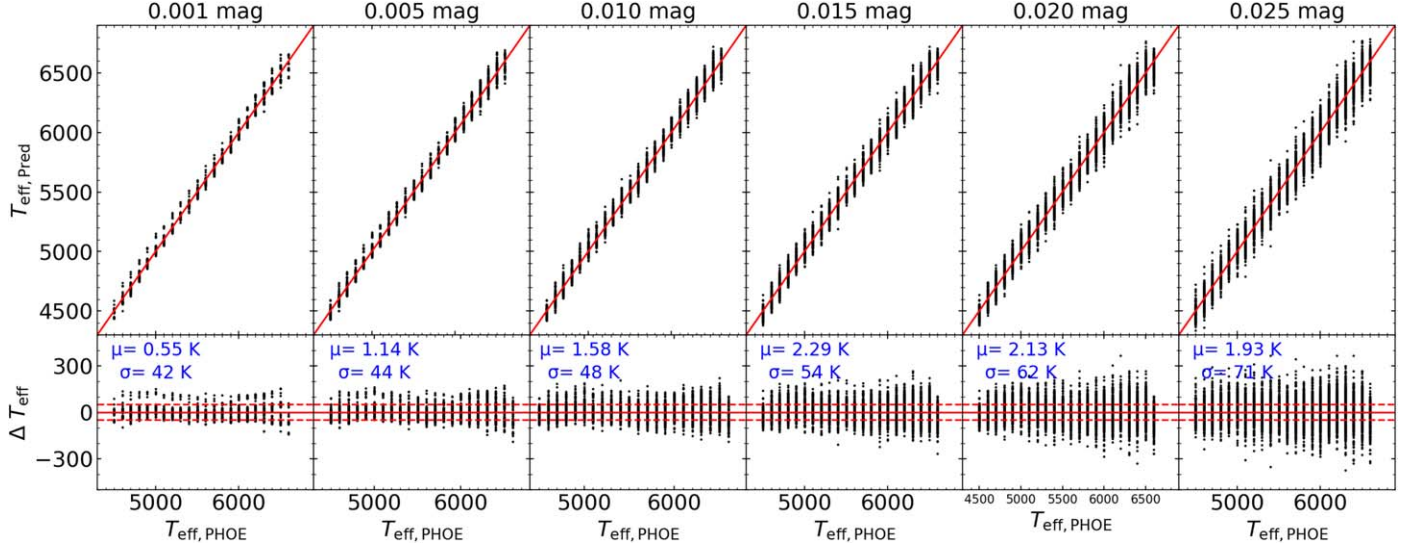


Figure 12. Comparisons of predicted effective temperature from $g-i$ color and effective temperature from PHOENIX spectra of dwarf stars for CSST filter systems. $\Delta T_{\text{eff}} = \pm 50$ K lines are plotted to guide the eye.

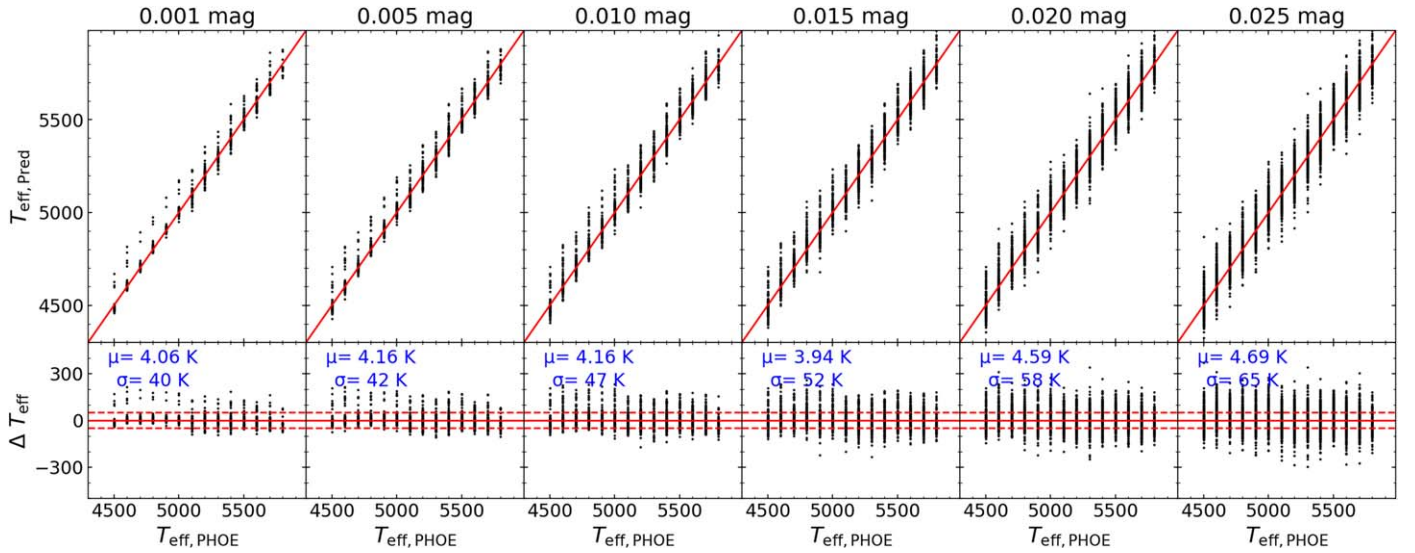


Figure 13. Similar to Figure 12 but for giant stars.

the metallicity estimate to be better than 0.20 dex for stars with g -band magnitude down to 20.8 (color error smaller than 0.01 mag).

6. Tests on Performances of Estimating Effective Temperature

In this section, tests on performances estimating effective temperature are performed. Similar to that illustrated in Section 5, the essential one is to construct the metallicity-dependent T_{eff} -color relations. To accomplish that, second-

order 2D polynomials are adopted to fit the data points for dwarf and giant stars, respectively (Figure 11):

$$\theta_{\text{eff}} = a_{0,0} + a_{0,1}y + a_{0,2}y^2 + a_{1,0}x + a_{1,1}xy + a_{2,0}x^2. \quad (10)$$

where $\theta_{\text{eff}} = 5000/T_{\text{eff}}$, x denotes $(g-i)$ and y denotes $[\text{Fe}/\text{H}]$. Three-sigma clipping is applied in the fitting process. The fit coefficients are listed in Table 3.

The performance results for estimating effective temperature from $g-i$ color are shown in Figures 12 and 13. High precision of effective temperature is achieved for CSST broadband photometry, with typical values around 48 and 47 K for

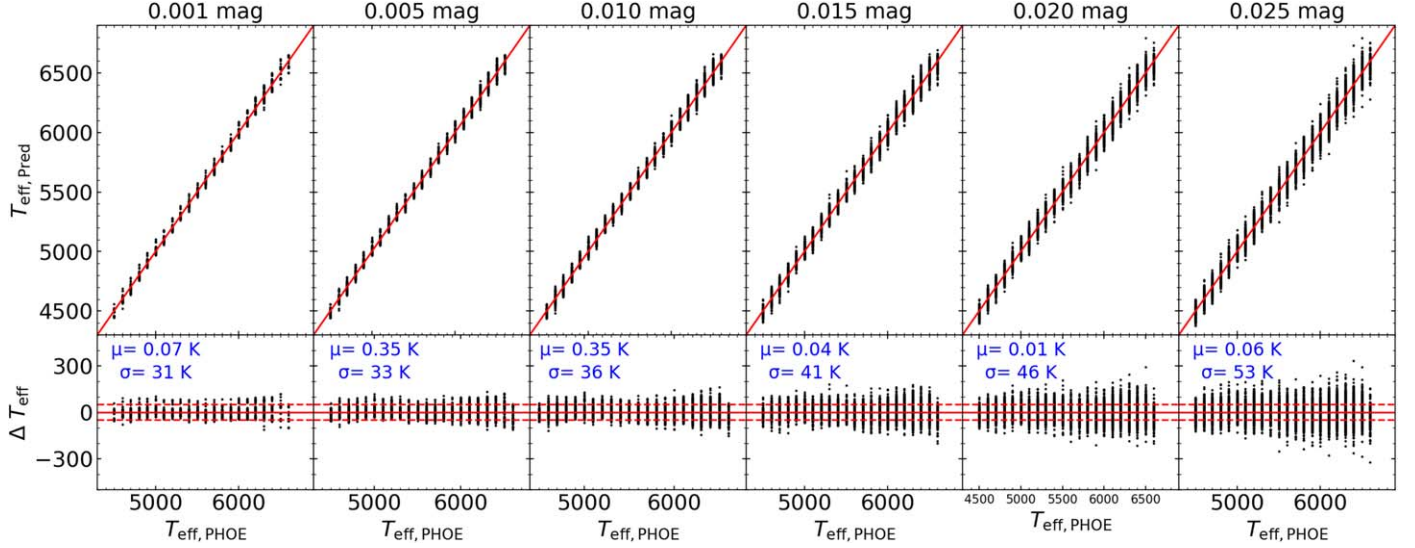


Figure 14. Similar to Figure 12 but for estimating effective temperature of dwarf stars from $g - z$ color.

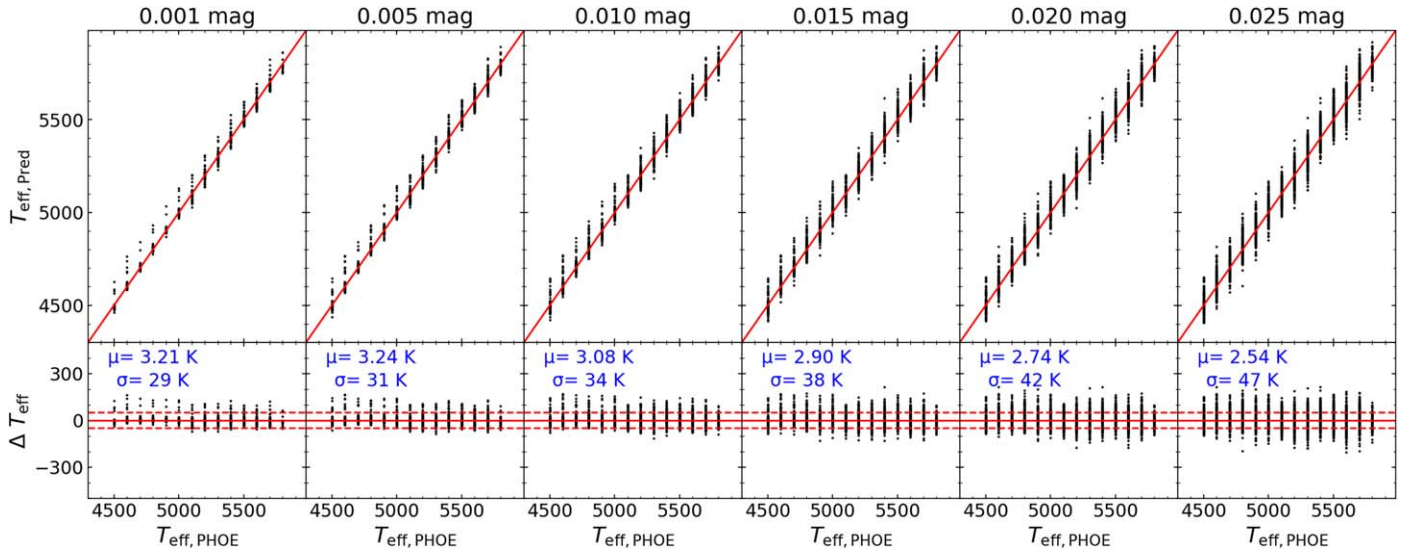


Figure 15. Similar to Figure 12 but for estimating effective temperature of giant stars from $g - z$ color.

dwarf and giant stars, respectively. For tests from dwarf stars, the precision of the predicted effective temperature lies within 50 K when the random error of color is smaller than 0.01 mag. Even for the maximum color error in our mock data tests, the precision is high as well, with a value of around 70 K. For giant stars, the precision could be slightly better, which is smaller than 47 K even if a random color error of 0.01 mag is given. This again shows the powerful capability of measuring stellar atmospheric parameters from the CSST survey.

Moreover, tests on estimates of effective temperature from $g - z$ and $g - y$ colors are also done using similar metallicity-

dependent T_{eff} -color relations, as described by Equation (10). The fit coefficients are listed in Table 5. Figures 14 and 15 show the comparisons between T_{eff} predicted from $g - z$ color and the true T_{eff} for the dwarf and giant stars, respectively. Good agreement can be clearly seen. Compared to T_{eff} predicted from $g - i$ color, T_{eff} predicted from $g - z$ color achieves a higher precision.

Figures 16 and 17 show the comparisons between T_{eff} predicted from $g - z$ color and the true T_{eff} for the dwarf and giant stars, respectively. The precision of predicted T_{eff} is further improved, with typical values around 29 and 29 K for

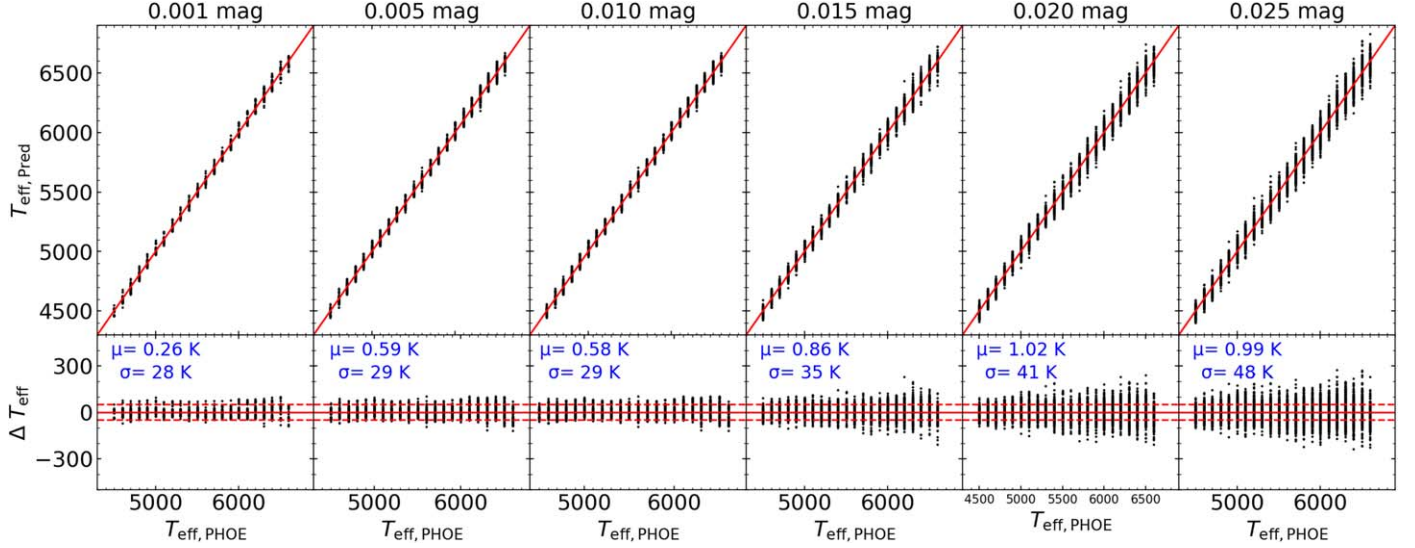


Figure 16. Similar to Figure 12 but for estimating effective temperature of dwarf stars from $g - y$ color.

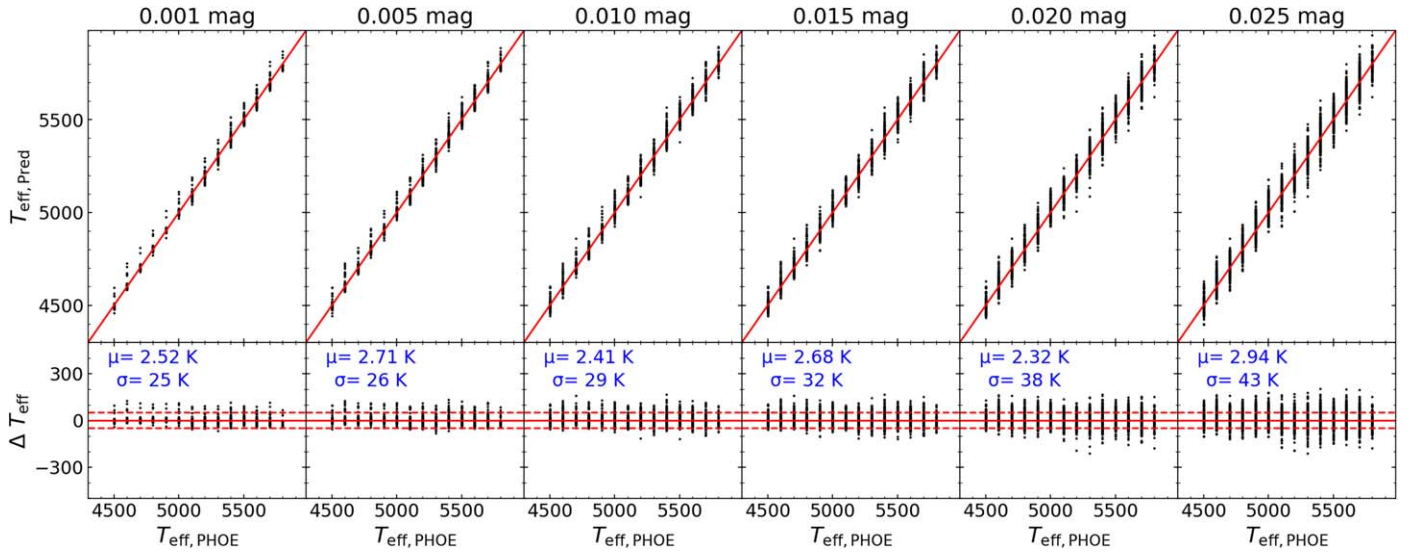


Figure 17. Similar to Figure 12 but for estimating effective temperature of giant stars from $g - y$ color.

dwarf and giant stars, respectively. Therefore, in the future T_{eff} estimates from the CSST survey, we recommend $g - y$ color to be the priority.

It is worth noting that uncertainties from photometric calibration and reddening correction are not taken into account in above analysis. Moreover, as discussed in Section 3, we may not make full use of the power of CSST broad-bands, especially the *NUV* filter due to the imperfect performance of the PHOENIX theoretical spectra. In the near future, we will continue to overcome these shortcomings to present more realistic analysis of CSST broad-bands on deriving stellar parameters.

Finally, we release a code¹⁰ to estimate stellar atmospheric parameters ($[\text{Fe}/\text{H}]$, T_{eff}) for CSST. Figure 18 shows the flowchart of our code.

7. Summary

Sensitivity of CSST broad-band colors to stellar atmospheric parameters (metallicity, $[\text{Fe}/\text{H}]$, surface gravity, $\log g$) is evaluated using synthetic colors integrated from model spectra. The result shows that colors from the optical and near-ultraviolet filter

¹⁰ <https://pypi.org/project/CSST-parameter/>

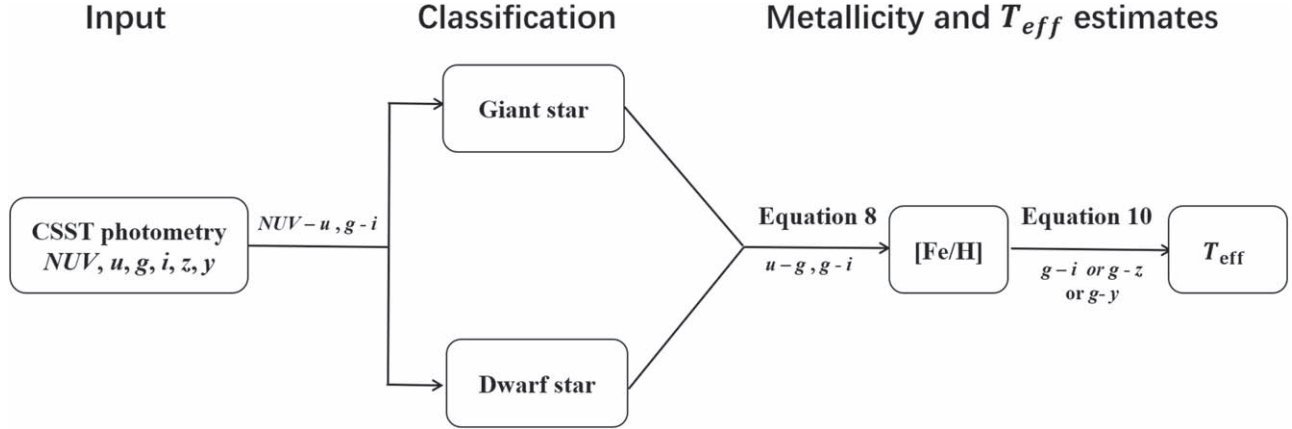


Figure 18. Flowchart of the code. Three modules are contained in our code including the input module, classification module, and the metallicity and efficient temperature estimates module.

systems adopted by the CSST survey show significant sensitivities to the stellar atmospheric parameters, in particular the metallicity. Sensitivity of color to metallicity of giant stars is higher than that from dwarf stars, although with slightly larger scatter.

According to our mock data tests, dwarf stars can be distinguished from giant stars. CSST can offer accurate stellar metallicity and effective temperature estimates for stars with g -band magnitude down to 20.8, with the high precision around 0.20 dex and 50 K, respectively. It is inspiring that the assembly history of the Milky Way can be further revealed using such a large sample of stars with accurate estimates of stellar atmospheric parameters.

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